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(54) EVALUATION AND COACHING OF ATHLETIC PERFORMANCE

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- (51) Int. Cl. *G09B 19/00* (2006.01) *A63B 24/00* (2006.01) (Continued)
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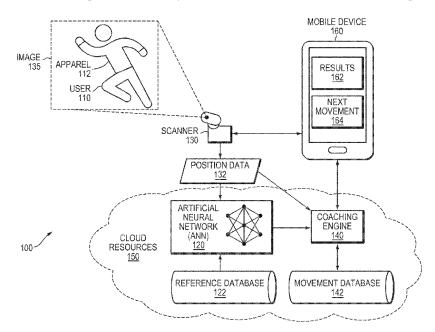
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(57) **ABSTRACT**

An automated system provides for tracking and evaluation performance of an athlete. An athlete is tracked during performance of a movement, and position data of the performance is applied to an artificial neural network (ANN) trained via a reference data set representing recorded movements. Using the ANN, rank data for the performance is be determined, where the rank data indicates a relationship between the performance of the movement and a subset of the plurality of recorded movements. Based on the rank data, the athlete can be presented with an evaluation of the performance, instructions for subsequent movements and suggestions for improving the athlete's performance.

24 Claims, 7 Drawing Sheets



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(2006.01)
(2006.01)

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CPC A61B 5/7267 (2013.01); A63B 24/0006 (2013.01); A63B 71/0622 (2013.01); G06K
9/00342 (2013.01); G09B 19/003 (2013.01); A61B 5/1118 (2013.01); A61B 2503/10 (2013.01); A63B 2220/12 (2013.01); A63B 2220/40 (2013.01); A63B 2220/836 (2013.01); A63B 2225/50 (2013.01); A63B 2230/04 (2013.01); A63B 2225/50 (2013.01); A63B 2230/04 (2013.01)

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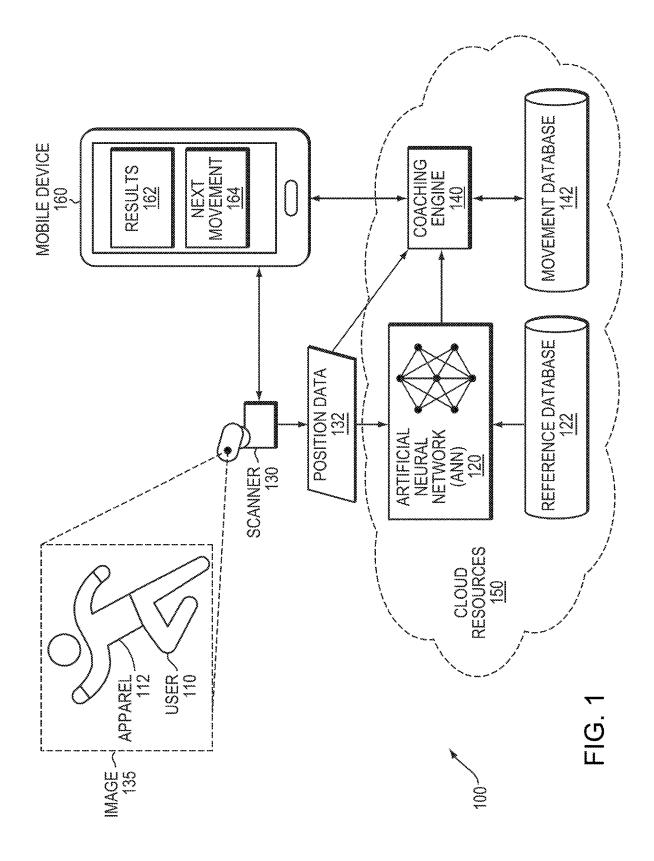
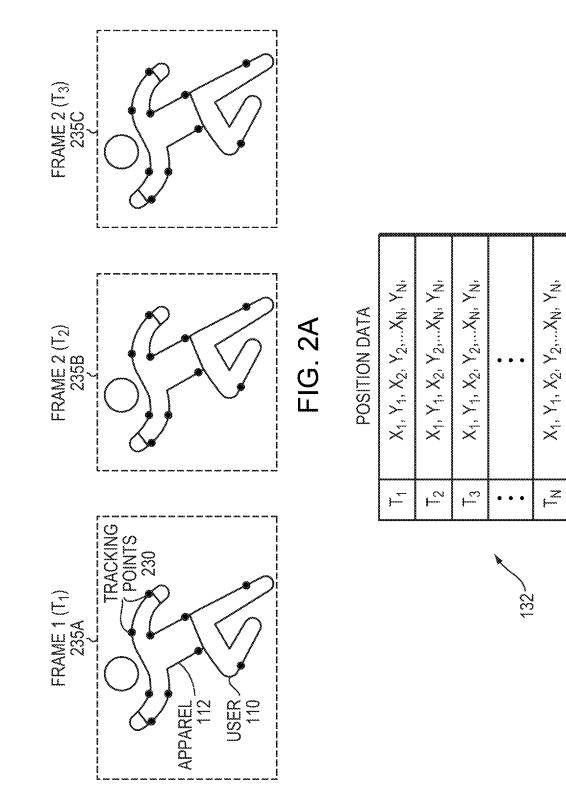
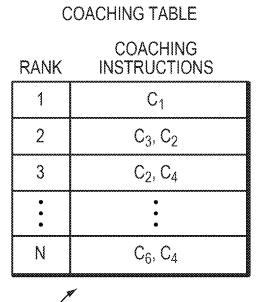


FIG. 2B

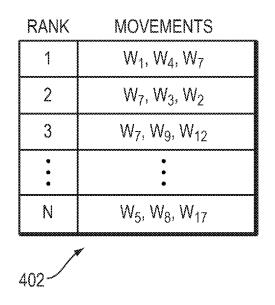


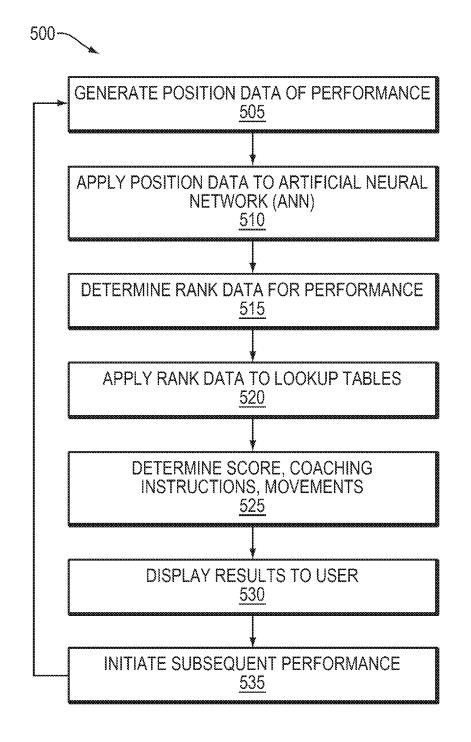
REFERENCE DATA SET

MOVEMENT ID	MOVEMENT DATA	RANK DATA
MOVEMENT 1	M ₁	[0,2,4]
MOVEMENT 2	M ₂	[3,7,1]
MOVEMENT 3	M ₃	[0,7,2]
•	•	• •
MOVEMENT N	M _N	[2,2,5]



MOVEMENT TABLE



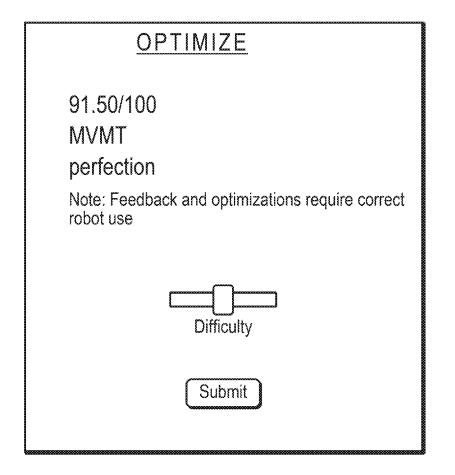


		DAY	3	
	Week 1	Week 2	Week 3	Week 4
SMR				
AIS				
NMA				
MS				

			Back Squat		
	x5	x5	<u>x5</u>	x5	
	x5	x5	x5	x5	
	х5	x5	x5	x5	
	x5	x5	x5	x5	
	x5	x5	x5	x5	
Day 1					
,		Gobl	et Lateral Lunge	****	
	super set				
	Sissy Squat 4x50				
	x8	x8	x8	X8	
	x8	x8	x8	x8	
	x8	x8	x8	x8	
	x8	x8	X8	x8	

		7 MW	15, 10, 10 Drops			
	SL Extensions 15, 10, 10 Drops					
	x15	x15	x15	x15		
	x15	x15	x15	x15		
	x15	x15	x15	x15		
Day 2	DROP	DROP	DROP	DROP		
Lody 2		Goblet Squa	at 15, 10, 10 Dro	<u>DS</u>		
		Extensions	15, 10, 10 Drop	S	~~~~~	
	x15	x15	x15	x15		
	x15	x15	x15	x15		
	x15	x15	x15	x15		
	FAIL	FAIL	I FAIL	FAIL		

	30s ON 15s OFF 3 Rounds
	Matrix Parachute Run
Day 3	Atlas Ball Over Shoulder Chains
	Hollow Rocking



EVALUATION AND COACHING OF ATHLETIC PERFORMANCE

RELATED APPLICATIONS

This application claims the benefit of U.S. Provisional Application No. 62/513,123, filed on May 31, 2017; and U.S. Provisional Application No. 62/400,928, filed on Sep. 28, 2016. The entire teachings of the above applications are incorporated herein by reference.

BACKGROUND

Coaching an individual for an athletic pursuit, or other goals relating to fitness, is a subjective practice that typically ¹⁵ requires in-person consultation. A coach will observe an athlete's performance and, drawing on experience and expertise, advise the athlete on how to improve his or her performance. The coach might offer suggestions for improving the movements observed by the coach, recommenda-²⁰ tions for an exercise routine, and advice on diet and nutrition. By harnessing the expertise of a coach, an athlete can make great strides in his or her performance.

SUMMARY

Example embodiments include a method of training an athlete. Position data is generated based on image data of an athlete during performance of a first movement, where the position data indicates position of the athlete over time 30 during the performance of the first movement. The position data may then be applied to an artificial neural network (ANN) trained via a reference data set representing a plurality of recorded movements of a movement category common to the first movement. The reference data set can 35 include position data and a reference rank value for each of the plurality of recorded movements. Using the ANN, a rank value for the performance of the first movement can be determined, where the rank value indicates a relationship between the performance of the first movement and a subset 40 in one embodiment. of the plurality of recorded movements. Based on the rank value, instructions for a second movement can be determined, and the athlete can be notified of the instructions. It should be understood that an ANN is an example of a processing technique and that other forms of processing can 45 be employed to perform the operations disclosed herein.

In further embodiments, the second movement may belong in a movement category common to the first movement, and the instructions for the second movement advise the athlete to perform the second movement differently from 50 follows. the performance of the first movement. Further, a performance of the second movement can be captured and processed in a manner comparable to the first movement, providing the athlete with further instructions. A des follows. FIG. embodim cloud re athlete)

In still further embodiments, the athlete may be notified of 55 a distinction between the performance of the first movement and at least one of the recorded movements. At least one of the recorded movements may have a respective rank value greater than the rank value of the performance of the first movement. The instructions for the second movement may 60 include instructions for traversing the distinction.

In yet further embodiments, the second movement may be of a movement category distinct from the movement category of the first movement. The second movement may include a plurality of subset movements, the instructions 65 specifying 1) a number of repetitions of the subset movements, 2) a time over which to perform the subset move-

ments, and/or 3) a distance over which to perform the subset movements. The instructions may also be based on an input by the athlete identifying a prospective improvement in the performance of the first movement.

Further embodiments may include determining a measure of fatigue of the athlete during the performance of the first movement based on the position data, and instructions for the second movement may be based on the measure of fatigue. Based on the measure of fatigue, an estimation of muscle fiber type for the athlete may be determined. Further, a group of movements may be determined based on the rank value, where the instructions are determined based on the athlete's selection among the group of movements. The reference rank value may be based on a manual assessment of the respective recorded movement. The image data of the athlete may be captured during performance of the first movement. A camera used for capturing the image data of the athlete may be calibrated, where the calibrating includes identifying a color of apparel worn by the athlete.

BRIEF DESCRIPTION OF THE DRAWINGS

The foregoing will be apparent from the following more particular description of example embodiments of the inven-²⁵ tion, as illustrated in the accompanying drawings in which like reference characters refer to the same parts throughout the different views. The drawings are not necessarily to scale, emphasis instead being placed upon illustrating embodiments of the present invention.

FIG. 1 is a diagram of a coaching system in one embodiment.

FIG. **2**A is a diagram illustrating capture of an athlete's movements.

FIG. **2**B is a table of position data representing an athlete's movements.

FIG. **3** is a table of a reference data set including movement data.

FIG. 4 illustrates tables of instructions to a user.

FIG. **5** is a flow diagram of a method of training an athlete in one embodiment.

FIG. 6 is a screenshot of a display including workout information.

FIG. 7 is a screenshot of a display including results of analyzing an athlete's movement.

DETAILED DESCRIPTION OF THE INVENTION

A description of example embodiments of the invention follows.

FIG. 1 is a diagram of a coaching system 100 in one embodiment. The system 100 may include a scanner 130 and cloud resources 150. A user 110 (also referred to as an athlete) may interface with the system 100 though a mobile device 160 (e.g., a smartphone or tablet, enlarged for clarity), which may be wirelessly communicatively coupled to the scanner 130 and/or the cloud resources 150 via a WiFi, Bluetooth or other communications protocol. The system 100 provides the user 110 with an evaluation of the user's performance of a movement (e.g., a given exercise, workout or fitness test), as well as coaching to improve the user's performance and other aspects of health and fitness.

Prior to a coaching session with the system 100, the user 110 may set up the scanner 130 within a training environment. Specifically, the camera of the scanner 130 may be pointed towards the user 110 so as to capture images of the user 110 during performance of a movement. For example,

if the movement to be evaluated is a box jump, the scanner 130 may be configured so that the full range of the user's movement, including the beginning and end of the box jump, are captured within the frame of each image. The scanner 130 may also be calibrated by registering the color 5 or appearance of the user's apparel 112, thereby improving recognition of the user's movements. The user 110 may facilitate this calibration by interacting with the mobile device 160 to complete a calibration process 160. The scanner 130 may include the camera as well as image 10 processing circuitry and a wired or wireless network interface to transmit captured image data. A single-board computer (SBC), such as a Raspberry PiTM computer, may be implemented in the scanner 130 to provide such processing and interface functions. In alternative embodiments, the 15 mobile device 160 may be implemented in place of, or supplemental to, the scanner 130, where a camera integral to the mobile device 160 captures images of the user's performance

To initiate a coaching session with the system 100, the 20 user 110 may interact with the mobile device 160. Here, the user 110 may select from a range of different movements to be evaluated, which can be presented as various examinations for physical fitness, muscle fiber type, or a specific movement. Upon selection of a test, the user 110 follows 25 instructions presented on the mobile device 160 to perform the movement. During the performance, the scanner 130 captures images (e.g., image 135) of the user 110 and generates position data 132 representing the user's position in each image. Alternatively, the scanner 130 may simply 30 capture the image data without further processing, instead forwarding the image data to the cloud resources 150 or mobile device 160 to generate the position data 132. A process of image capture and generating the position data 132 is described in further detail below with reference to 35 FIGS. 2A-B.

The cloud resources 150 may include an artificial neural network (ANN) 120, a coaching engine 140, a reference database 122, and a movement database 142. The ANN 120 may be emulated by suitable computing resources, such as 40 a computer server including one or more graphics processing units (GPUs), and may be trained by reference data at the reference database 122. Reference data may include data regarding previously performed movements, as well as evaluation data for those movements. An example reference 45 data set is described in further detail below with reference to FIG. 3. The ANN 120 may include a plurality of distinct sub-ANNs, where each ANN is trained with data of a particular movement category (e.g., box jumps). The position data 132 may be applied to the ANN 120, and, in 50 particular, to the sub-ANN that is trained for the movement category matching the movement performed by the user 110. The ANN 120 processes the position data 132 to determine similarities between the performed movement and the movements represented in the reference data. Based on the 55 determined similarities, the ANN 120 outputs rank data, which identifies such similarities, to the coaching engine **140**. For example, the rank data can indicate or include 1) which one or more of the movements represented by the reference data is most similar to the performed movement; 60 2) a class or subset of the reference movements that is a best match for the performed movement, where each class may correspond to a given characteristic, performance level, or flaw in the movement; or 3) a numerical (e.g., X out of 100) or graded ranking of the performed movement derived from 65 a subjective (e.g., coach-observed) evaluation of the reference movements most similar to the performed movement.

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The coaching engine 140 implements the rank data, data about the user (e.g., gender, weight, age, goals, and physical abilities measured in previous coaching sessions), and, optionally, the position data 132, to determine coaching information for the user 110. To do so, the coaching engine 140 may reference the movement database 142. The movement database 142 may store one or more lookup tables cross-referencing rank data and/or position data with coaching information. The coaching information can include coaching instructions (e.g., correction to form of a movement), descriptions of movements (e.g., workout routines), evaluation of the performance (e.g., a "grade" ranking the performance) and/or other suggestions to inform the user 110. Example coaching information is described below with reference to FIG. 4. As a result of referencing the movement database 142, the coaching engine 140 can determine appropriate coaching information for the user 110 and present the information via the mobile device 160. For example, the mobile device 160 may display results 162 of the performance (e.g., time, ranking, grade) and instructions for a next movement 164 (e.g., instructions to correct a deficiency in the performance, a workout routine). The coaching engine 140 may also store the results of the performance, such as rank data and position data 132, to the movement database 142, and may reference those results when evaluating subsequent performances by the user 110.

FIG. 2A is a diagram illustrating detection of the user's position during performance of the movement. Frames 235A-C represent successive images during the performance as captured, for example, by the scanner 130 described above with reference to FIG. 1. The frames 235A-C depict the user 110 moving position relative to the camera's field of view (FOV). In order to track the user's movements, the scanner 130 may identify a plurality of tracking points 230. The tracking points 230 may be designated first during a calibration process as described above, and can be maintained during the user's motion as a result of cross-referencing the user's image between successive images. The scanner 130 may reference the user's apparel 112 to assist in maintaining the tracking points 230, and may identify the apparel 112 by contrast (e.g., color or pattern difference) against other object in the image. For example, the scanner 130 may maintain the tracking points at relative points along a silhouette of the apparel 112 and other portions of the user 110.

FIG. 2B is a table of the position data 132 representing the user's movements. The first column identifies the time stamp for a given frame (shown as $T_1 \ldots T_N$), and the second column includes coordinates of each of the tracking points 230 in the given frame. For example, the column may include numerical, X-Y coordinates for each of the tracking points 230 (e.g., X_1 , Y_1 , X_2 , Y_2 . . . X_N , Y_N) as they are delineated in the 2D plane of the frame. The X-Y coordinates may be captured as the pixel coordinates of the given frame, and may be entered into the ANN 120 or may first be translated to physical coordinates (e.g., via the use of an object of known size to provide a scale, or via an estimate based on the recorded velocity of the movement). Alternatively, if the scanner 130 (alone or in combination with another device, such as the mobile device 160) captures stereoscopic or other 3D image data of the user 110, then the position data 132 may include 3D coordinates of the tracking points 230. 3D image data, in particular, can aid in determining the physical coordinates of the tracking points 230 through the movement.

FIG. **3** is a table of a reference data set **300**. The reference data set **300** may be stored in the reference database **122** of

FIG. 1, and may be employed to train the ANN 120. The reference data set 300 may be specific to a particular movement category, wherein all of the entries represent movements of a common type (e.g., a box jump). For example, each entry may represent a previously recorded 5 demonstration of the movement, which may have been captured by a process comparable to that described above with reference to the system 100. In order to provide coaching and evaluation for a range of different movements, the reference database 122 may include a plurality of 10 different reference data sets, each data set pertaining to a different movement category. Each reference data set can be implemented to train a respective ANN.

The reference data set **300** includes a first column including a "movement identifier" (ID) for each of the represented 15 movements. A second column stores movement data, which includes information about the movement. The movement data can include, for example, data comparable to the position data **132** shown in FIG. **2B**, including a succession of tracking point coordinates and respective timestamps. In 20 order to optimize the training of the ANN **120**, the movement data may be recorded by means comparable to that by which the position data **132** is recorded (e.g., via the scanner **130** or a comparable device, and the recorded athlete following instructions comparable to those presented to the 25 user **110** prior to the performance). As a result, the ANN **120** may be sufficiently adapted to identify parallels between the position data **132** and the reference data set **300**.

A third column of the reference data set 300 stores rank data. The rank data for each movement may include numer- 30 als or other code identifying objective and/or subjective information about the movement. For example, a first numeral may identify a "grade," or subjective evaluation, or the movement as determined by a human coach observing the movement. This evaluation may also correspond to a 35 ranking (e.g., a percentile value) of the movement relative to other movements. A second numeral may identify one or more flaws in the movement, such as a deficiency in technique, as determined by the coach. A third numeral may identify objective information about the movement, such as 40 the identity of the athlete performing the movement, or the total time in which the movement was completed. A fourth numeral may identify information about the athlete performing the movement, such as the athlete's muscle fiber type.

The ANN 120, being trained with the reference data set 45 300, processes the user's position data 132 to identify parallels between the position data 132 and the reference data set 300. As a result, the ANN 120 determines appropriate rank data for the position data 132. This data, referred to as user rank data, is output by the ANN 120 to the 50 coaching engine 140. The coaching engine 140, in turn, applies the user rank data to one or more lookup tables to determine appropriate evaluation and coaching information corresponding to the user's performance. Example lookup tables are described in further detail with reference to FIG. 55 4 below.

FIG. 4 illustrates lookup tables 401, 402 for cross-referencing rank data and coaching information. With reference to FIGS. 1 and 3, the coaching engine 140 may apply the user rank data to the tables 401, 402. The coaching table 401 60 correlates a rank value with coaching instructions (C_1 - C_N), which represent instructions that may be provided to a user 110 to improve the users performance. For example, instruction C_1 may correspond to suggestions for modifying the user's form when performing the movement, and instruction 65 C_2 may correspond to a suggestion for a pre-performance action (e.g., a stretch or mobility work) to improve the user's 6

range of motion. To optimize data storage, the table **401** may store pointers to instructions rather than the instructions themselves, where C_1 - C_N point to the instructions located in another table (not shown) stored in the movement database **142** or another database.

The movement table **402** correlates a rank value (which may be distinct from the rank values applied to the coaching table **401**) with movements (W_1 - W_N), which represent a range of suggestions that may be presented to the user **110**. For example, W_1 may correspond to a variation of the movement performed by the user **110**, W_2 may correspond to a structured interval training routing, W_3 may correspond to a structured strength training routine, W_4 may correspond to a mobility routine, W_5 may correspond to an endurance training routine (e.g., swimming, distance running), and W_6 may correspond to a diet recommendation. Similarly to the table **401**, the table **402** may store pointers to the above movements as located in another table (not shown).

Upon applying the user rank values to the tables 401, 402, the coaching engine 140 may compile the corresponding coaching instructions and movements and present them to the user 110 via the mobile device 160, and may be included in the results 162 and next movement 164. If the coaching engine 140 presents a suggested movement that can be tracked by the system 100, and the user 110 selects that movement, then the system 100 may carry out a subsequent process of tracking and evaluating the user's performance of the suggested movement. The coaching engine 140 can also present the user rank data directly (e.g., a rank value that indicates a grade or percentile of the performance), can present objective measurements of the performance based on the position data 132 (e.g., time completed, velocity, acceleration), or can apply the user rank data to other lookup tables or data sources to present other information to the user 110. For example, the user rank data and/or position data 132 may be compared against data regarding previous performances by the user 110 to determine whether how the user's performance has changed or improved. Similarly, the user rank data and/or position data 132 may be compared against data regarding performances by other athletes, informing the user 110 how his/her performance compares to those performances.

In a further embodiment, the coaching engine 140 may estimate the muscle fiber composition of the user 110 based on the position data 132 and/or user rank data. The user rank data may include such an estimate directly (e.g., as a result of the ANN 120 being trained with known muscle fiber types included in the reference data set 300), or may be calculated based on the position data 132.

FIG. 5 is a flow diagram of an example process 500 of training an athlete in one embodiment. The process 500 may be implemented by the system 100 of FIG. 1, and may incorporate one or more of the features described above with reference to FIGS. 1-4. Upon initiating a coaching session, the scanner 130 captures images of the user's performance in completing a movement, and generates corresponding position data 132 (505). The position data 132 is uploaded to the cloud resources 150, where it is applied to the ANN 120 trained on a reference data set 300 of a common movement category (510). Through the ANN 120, the user rank data for the performance is determined (515). The coaching engine 140 then applies the user rank data to lookup tables 401, 402 (520), and determines a performance score, coaching instructions and suggestions for movements (e.g., structured workout routines) (525). The results are then presented to the user 110 at the mobile device 160 (e.g., results 162 and next movement 164) (530). If the user 110

selects the next movement 164 for evaluation, then a subsequent performance is initiated (535), and the process 500 is repeated to evaluate the subsequent performance.

Further embodiments may be configured to provide coaching in physical therapy applications. In such an appli-5 cation, as well as in other training applications, the process 500 may be initiated after a user 110 selects a movement (e.g., a rehabilitation movement) to perform from a menu of movements presented at a user interface (e.g., mobile device **160**). The operations of analyzing the recorded movement 10 (510-525) may be configured to identify and coach specific flaws in the movement related to given injuries from which the user 110 may be recovering. Accordingly, the results displayed to the user 110 (530) may include particular guidance for improving the movement, such as range of 15 motion, velocity, subjective quality of movement based on comparable reference movements, and coaching suggestions for movements and exercises to improve the user's performance

FIG. **6** is a screenshot of a display including workout ²⁰ information. The workout information may include a structured workout routine, including a listing of movements to be performed, as well as a calendar organizing the timing of the routine. The workout information may be configured by the coaching engine **140**, and may be based on suggested ²⁵ movements retrieved from the lookup table **402**. The display may also include spaces where the user **110** can manually enter results of the workout (e.g., weight lifted, time completed).

FIG. 7 is a screenshot of a display including results of 30 evaluating an athlete's performance. The display includes a score ("91.50/100") for the performance of a movement, which may be derived from the user rank data, the position data **132**, and/or a lookup table (e.g., tables **401**, **402**). The display also includes a difficulty slider, enabling the user **110** 35 to select a relative difficulty for the next movement to perform. In response to this selection, the coaching engine **140** may modify established movements from the movement database **142** to create a movement having higher or lower difficulty.

Example embodiments may include a computer program product, including a non-transitory computer-readable medium (e.g., a removable storage medium such as one or more DVD-ROM's, CD-ROM's, diskettes, tapes, etc.) that provides at least a portion of the software instructions for the 45 invention system. The computer program product can be installed by any suitable software installation procedure, as is well known in the art. In another embodiment, at least a portion of the software instructions may also be downloaded over a cable communication and/or wireless connection. 50

While this invention has been particularly shown and described with references to example embodiments thereof, it will be understood by those skilled in the art that various changes in form and details may be made therein without departing from the scope of the invention encompassed by 55 the appended claims.

What is claimed is:

1. A computer-implemented method of training an athlete, comprising:

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generating position data based on image data of an athlete during a first performance of a movement, the position data including pixel coordinates of a plurality of tracking points associated with the athlete for multiple frames of the image data, the position data indicating 65 position of the athlete over time during the first performance of the movement;

- applying the position data to an artificial neural network (ANN) trained via a reference data set representing a plurality of recorded performances of the movement, the reference data set including position data and a reference rank value for each of the plurality of recorded performances;
- identifying, via the ANN, a correlation between the position data and at least one of the recorded performances of the movement;
- determining, via the ANN, a rank value for the performance of the first movement based on the correlation, the rank value indicating a relationship between the first performance of the movement and a subset of the plurality of recorded performances;
- applying the rank value to a table to identify coaching instructions corresponding to the rank value, the table cross-referencing a plurality of rank values and coaching instructions corresponding to each of the plurality of rank values;
- determining instructions for a second performance of the movement by selecting from the coaching instructions corresponding to the rank value, the second performance corresponding to the first performance with the exception of a correction to form of the first performance, the instructions for the second performance including instructions to perform the second performance in a manner distinct from the first performance; and
- notifying the athlete of the instructions for the second performance of the movement.
- **2**. The method of claim **1**, further comprising:
- capturing image data of an athlete during the second performance of the movement;
- determining, via the ANN, a rank value for the second performance of the movement, the rank value indicating a relationship between the second performance of the movement and a subset of the plurality of recorded performances;
- comparing the rank values of the first and second performances; and

notifying the athlete based on the comparison.

3. The method of claim **1**, further comprising notifying the user of a distinction between the first performance and at least one of the recorded performances.

4. The method of claim **3**, wherein the at least one of the recorded performances has a respective rank value greater than the rank value of the first performance.

5. The method of claim **3**, wherein the instructions for the second performance include instructions for traversing the ⁵⁰ distinction.

6. The method of claim 1, further comprising determining instructions for a further movement based on the rank value, the further movement being of a movement category distinct from the movement category of the movement.

7. The method of claim 1, wherein the second performance includes a plurality of subset movements, the instructions specifying at least one of 1) a number of repetitions of the subset movements, 2) a time over which to perform the subset movements, and 3) a distance over which to perform the subset movements.

8. The method of claim **1**, wherein determining the instructions for the second performance is further based on an input by the athlete identifying a prospective improvement in the first performance.

9. The method of claim **1**, further comprising determining a measure of fatigue of the athlete during the first performance based on the position data.

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10. The method of claim **9**, wherein determining instructions for the second performance is based on the measure of fatigue.

11. The method of claim **9**, further comprising determining an estimation of muscle fiber type for the athlete based ⁵ on the measure of fatigue.

12. The method of claim **1**, further comprising determining a group of movements based on the rank value, and further comprising determining a further movement based on a selection, by the athlete, of the further movement from among the group of movements.

13. The method of claim **1**, wherein the reference rank value is based on a manual assessment of the respective recorded performance.

15 14. The method of claim 1, further comprising capturing the image data of the athlete during the first performance.

15. The method of claim 14, further comprising calibrating a camera used for capturing the image data of the athlete, the calibrating including identifying a color of apparel worn $_{20}$ by the athlete.

16. A computer-implemented method of training an athlete, comprising:

- generating position data based on image data of an athlete during performance of a first movement, the position ²⁵ data including pixel coordinates of a plurality of tracking points associated with the athlete for multiple frames of the image data, the position data indicating position of the athlete over time during the first performance of the first movement; ³⁰
- applying the position data to an artificial neural network (ANN) trained via a reference data set representing a plurality of recorded performances of the movement, the reference data set including position data and a reference rank value for each of the plurality of ³⁵ recorded performances;
- identifying, via the ANN, a correlation between the position data and at least one of the recorded performances of the movement;
- determining, via the ANN, a rank value for the performance of the first movement based on the correlation, the rank value indicating a relationship between the performance of the first movement and a subset of the plurality of recorded performances;
- applying the rank value to a table to identify coaching ⁴⁵ instructions corresponding to the rank value, the table cross-referencing a plurality of rank values and coaching instructions corresponding to each of the plurality of rank values;
- determining a group of distinct movements by selecting ⁵⁰ from the coaching instructions corresponding to the rank value;
- determining instructions for a second movement based on a selection, by the athlete, among the group of distinct movements; and
- notifying the athlete of the instructions for the second movement.

17. The method of claim 16, wherein the second movement is of a movement category distinct from the movement category of the first movement.

18. The method of claim **16**, wherein the second movement includes a plurality of subset movements, the instructions specifying at least one of 1) a number of repetitions of

the subset movements, 2) a time over which to perform the subset movements, and 3) a distance over which to perform the subset movements.

19. The method of claim **16**, wherein the reference rank value is based on a manual assessment of the respective recorded performance.

20. The method of claim **16**, further comprising determining a measure of fatigue of the athlete during the performance of the first movement based on the position data.

21. A system for training an athlete, comprising:

- an artificial neural network (ANN) trained via a reference data set representing a plurality of recorded performances of the movement, the reference data set including position data and a reference rank value for each of the plurality of recorded performances;
- a server configured to communicate with a scanner and a computing device across a network, the server configured to:
 - generate position data based on image data captured by the scanner of an athlete during a first performance of a movement, the position data including pixel coordinates of a plurality of tracking points associated with the athlete for multiple frames of the image data, the position data indicating position of the athlete over time during the first performance of the movement;

apply the position data to the ANN;

- identify, via the ANN, a correlation between the position data and at least one of the recorded performances of the movement
- determine, via the ANN, a rank value for the performance of the first movement based on the correlation, the rank value indicating a relationship between the first performance of the movement and a subset of the plurality of recorded performances;
- applying the rank value to a table to identify coaching instructions corresponding to the rank value, the table cross-referencing a plurality of rank values and coaching instructions corresponding to each of the plurality of rank values;
- determine instructions for a second performance of the movement selecting from the coaching instructions corresponding to the rank value, the second performance corresponding to the first performance with the exception of a correction to form of the first performance, the instructions for the second performance including instructions to perform the second performance in a manner distinct from the first performance; and

transmit the instructions for the second performance of the movement to the computing device.

22. The system of claim **21**, wherein the server is further configured to transmit to the computing device a notification of a distinction between the performance of the first movement and at least one of the recorded performances.

23. The system of claim **22**, wherein the at least one of the recorded performances has a respective rank value greater than the rank value of the first performance of the movement.

24. The system of claim 22, wherein the instructions for the second performance include instructions for traversing the distinction.

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